

# Concurrent Program Verification Using Likely Dataflow Invariants and Proof-guided Refinement

# Outline

- Background
- Problem
- Motivation
- Generating likely data-flow Invariants
- Underapproximation
- Our Idea
- Technical Details

# Background

- Safety property verification (assertion checking) on asynchronous concurrent programs with shared memory.
- Is property  $\varphi$  safe in  $L_C \cap L_D$  where  $L_C$  and  $L_D$  are control and data flow of the program.
- Harder than sequential programs (with procedures undecidable[Ramalingam]).
- However, with restriction on  $L_D$  we can transform concurrent program to non-deterministic sequential program.

# Background

## Restriction on $L_D$

- Context Bounded Analysis
  - Transformation to context bounded sequential programs.
  - First proposed in [Qadeer and Wu] and generalized in [Lal and Reps].
- Memory Unwinding
  - Bound on number of writes to shared memory.
  - Source to source transformation. [Tomasco et al.] and [Anand et al.]
- Partial orders with loop unwinding BMC [Alglave et al.].

# Background

## Sequentialization using Timestamps

```
int i = 1, j = 1;
void f1() {
  i = i + j;
  i = i + j;
}
void f2() {
  j = j + i;
  j = j + i;
}
void main() {
  thread t1, t2;
  create(t1, f1);
  create(t2, f2);
  join t1;
  join t2;
  assert(j <= 7 );
}
```

Original Program

pos	thr	var	val
1	1	i	2
2	2	j	3
3	2	j	5
4	1	i	7

Timestamp

```
int i = 1, j = 1, ct;
void f1() {
  write_i(read_i() + read_j());
  write_i(read_i() + read_j());
}
void f2() {
  write_i(read_j() + read_i());
  write_i(read_j() + read_i());
}
void main() {
  f1();
  f2();
  assert(j <= 7 );
}
```

Transformed Program

# Background

## Sequentialization using Timestamps

```
void write_i(int value) {  
    unsigned short loc=*;  
    assume(loc_i < loc < MAXW_i &&  
           free_i[loc] &&  
           ts_i[loc] > ct &&  
           value_i[loc] == value);  
    loc_i = loc;  
    free_i[loc] = false;  
    icount++;  
    ct = ts_i[loc];  
}
```

```
int read_i() {  
    unsigned short loc=*;  
    assume(loc_i <= loc < MAXW_i &&  
           ts_i[loc+1] > ct);  
    loc_i = loc;  
    if (ct < ts_i[loc]) ct = ts_i[loc];  
    return value_i[loc];  
}
```

# Problem

- Sequentialization [Anand et al.]: Is property  $\varphi$  safe in  $L_C \cap L_D$ 
  - $L_C$  is control flow of individual threads composed sequentially.
  - $L_D$  is all possible data-flow of shared memory represented using timestamps constraints.
- As the number of writes to consider increases so does the search space of the problem.
- Do we have to consider every possible data-flow?

# Motivating Example 1

## Unsafe Program

x=0, y=0

T1

```
1  while (y < NUM) {  
  //y = y + 1  
2   t = read_y();  
3   write_y(t+1);  
  //x = x + y  
4   t1 = read_x();  
5   t2 = read_y();  
6   write_x(t1+t2);  
7 }
```

T2

```
1  while (y < NUM) {}  
2  t = read_y();  
  // y = x + y  
3  t1 = read_x();  
4  t2 = read_y();  
5  write_y(t1+t2)  
6  assert(y == x + t)
```

When y's value is NUM-1 following sequence can violate assert():  
T1\_2 → T1\_3 → T2\_1 → T2\_2 → T2\_3 → T2\_4 → T1\_4  
→ T1\_5 → T1\_6 → T2\_5 → T2\_6

To infer this sequentialization considers both local(T1\_3) and remote(T2\_5) writes to read of y in T1\_2 and T1\_5.

However by considering only local writes to y we can still find this failure.



# Motivating Example 1

## Safe Program

x=0, y=0

T1

```
1  while (y < NUM) {  
  //x = x + y  
2   t1 = read_x();  
3   t2 = read_y();  
  /y = y + 1  
4   write_x(t1+t2);  
5   t = read_y();  
6   write_y(t+1);  
7 }
```

Read of y at T1\_3 and T1\_5 always reads local write T1\_6.

But sequentialization considers both local(T1\_6)  
and remote(T2\_5) writes.

T2

```
1  while (y < NUM) {}  
2  t = read_y();  
  //y = x + y  
3  t1 = read_x();  
4  t2 = read_y();  
5  write_y(t1+t2)  
6  assert(y == x + t)
```

# Observations

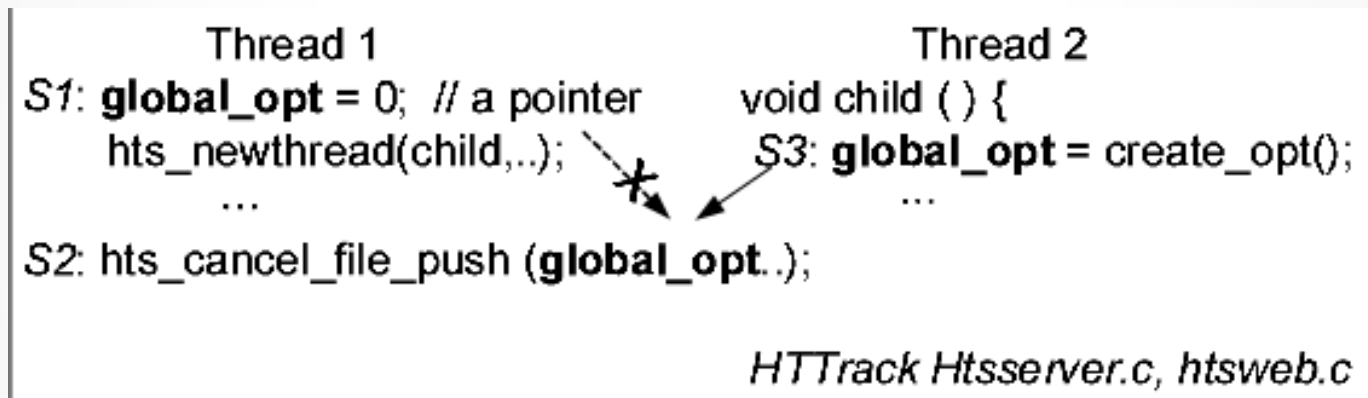
- Using  $L_C \cap L_{D'}$  where  $L_{D'} \subset L_D$  can reduce the search space.
  - Prove safety of  $\varphi$  is irrelevant of  $L_{D'} \subset L_D$
  - Or prove  $L_D \setminus L_{D'}$  is infeasible.
  - Or widen  $L_{D'}$  towards  $L_D$
- We can use UNSAT proof to prove irrelevance and widen  $L_{D'}$  towards  $L_D$
- Data-flow invariants can provide  $L_{D'}$  where  $L_{D'} \subseteq L_D$ 
  - Dynamic analysis tools can generate likely invariants faster.

# DefUse Invariants

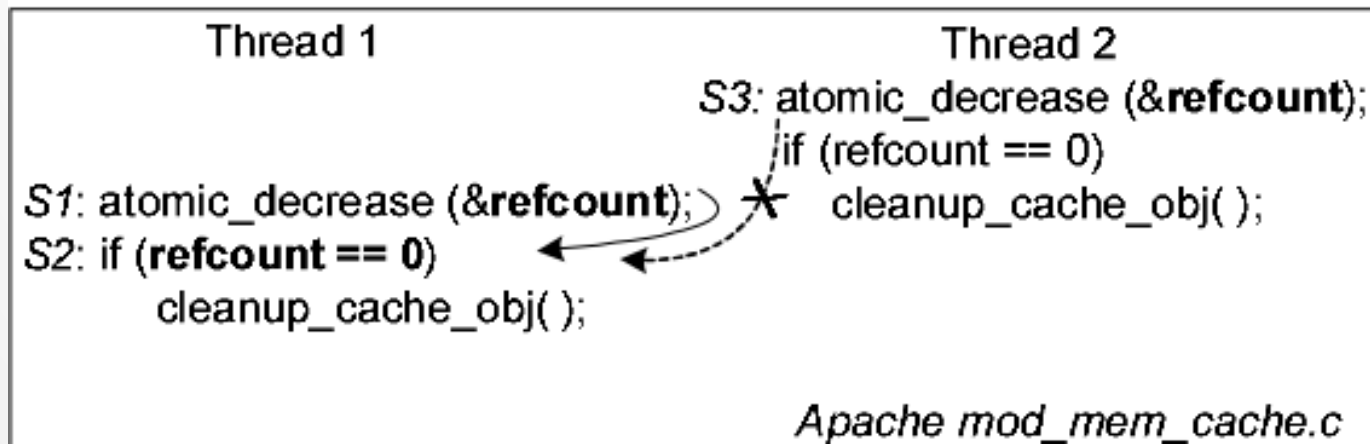
- DefUse[Shi et al.] is a dynamic analysis based bug-detection tool.
- Extracts definition and use relationship (“developer's intended data-flow”) by running the program under its test suite.
- Violation of discovered invariants are considered as potential bugs.
- Can generate false positives.

# DefUse Invariants

- Local/Remote: Read either reads from local thread or from remote thread.

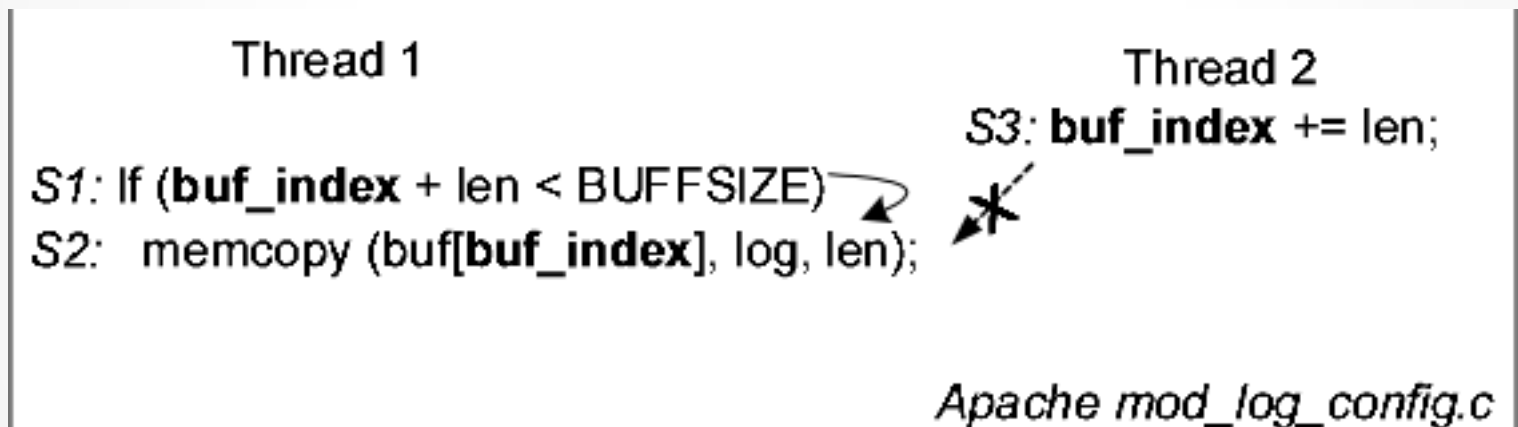


(a) Local/Remote (LR) invariant (always uses re



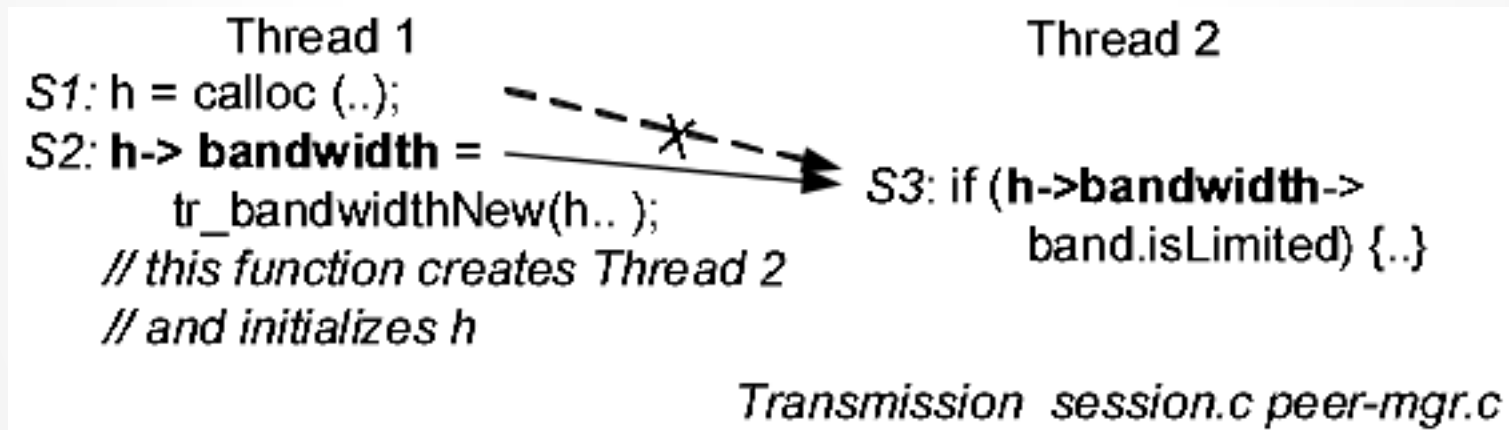
# DefUse Invariants

- Follower: Two consecutive reads uses same write.



# DefUse Invariants

- Definition Set: A read reads only from a set of writes.



# Proof by Underapproximation

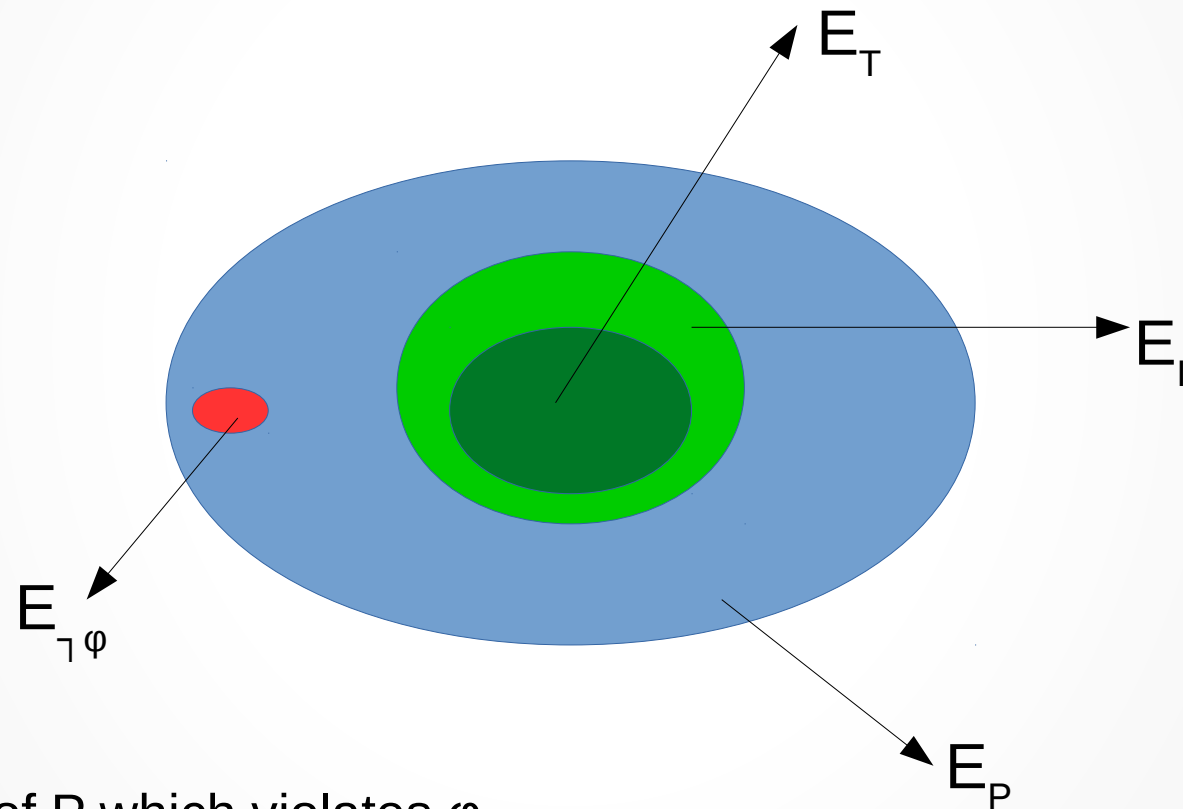
- $P' := P \wedge (I_1 \wedge I_2 \wedge \dots \wedge I_n)$  is an underapproximation of  $P$ , where  $I_1 \dots I_n$  are referred as constraints.
  - $P'$ ,  $P$  and  $I_1 \dots I_n$  are in CNF.
- If  $P'$  is satisfiable then so is  $P$ .
- UNSAT core/proof of  $P'$  is a subset of clauses of  $P'$  that is unsatisfiable.
- Given an UNSAT core of  $P'$  if none of  $I_1 \dots I_n$  are present in it then  $P$  is unsatisfiable.

# Our Idea

- We conjunct constraints to  $L_C \cap L_D$  to get  $L_C \cap L_{D'}$  where  $L_{D'} \subseteq L_D$
- This restriction gives us an underapproximation of original program.
- If the property is violated in this model then we report counterexample.
- Otherwise we refine/widen  $L_{D'}$  using UNSAT core.



# Our Idea



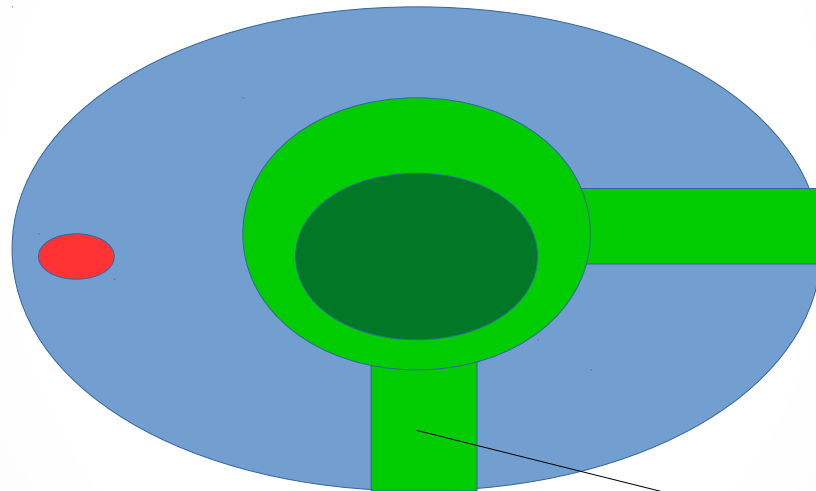
$E_{\neg\varphi}$  Executions of P which violates  $\varphi$

$E_T$  Executions under invariant generation tool

$E_I$  Executions that are covered by inavriants

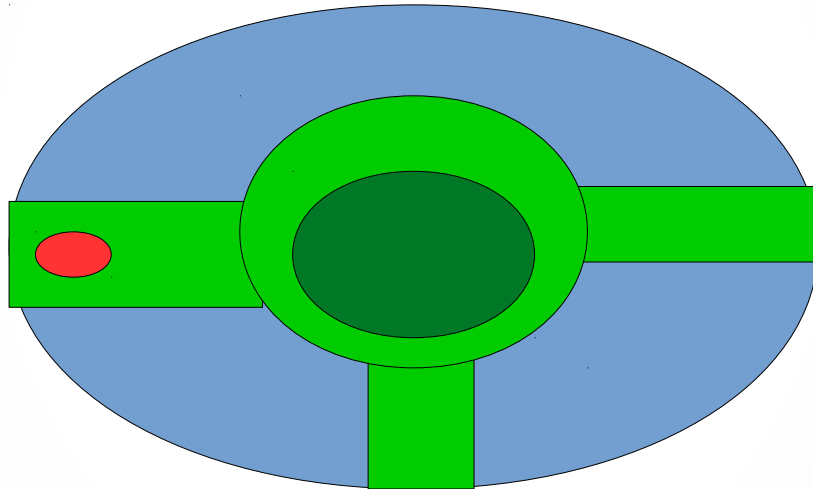
$E_P$  Actual program Executions

# Our Idea



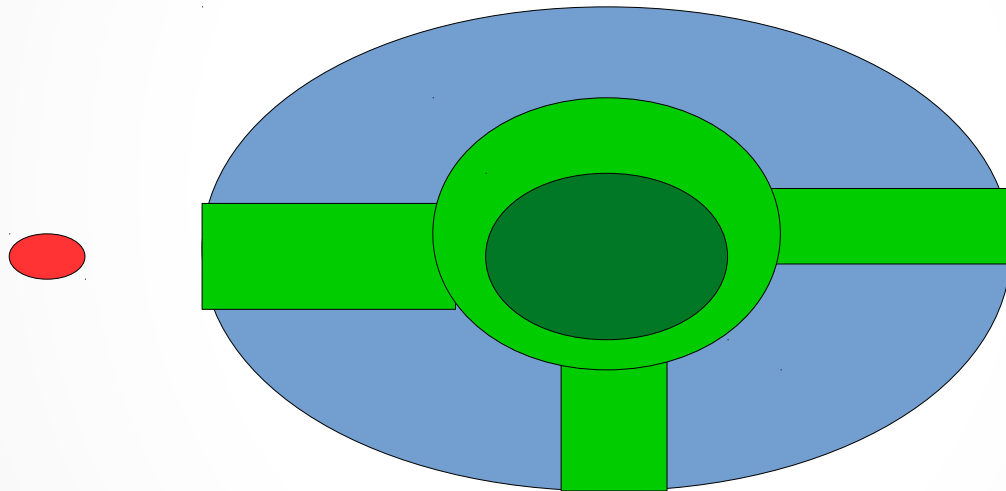
Executions after widening

# Our Idea



UNSAFE

# Our Idea



SAFE

Executions are irrelevant to the property or infeasible

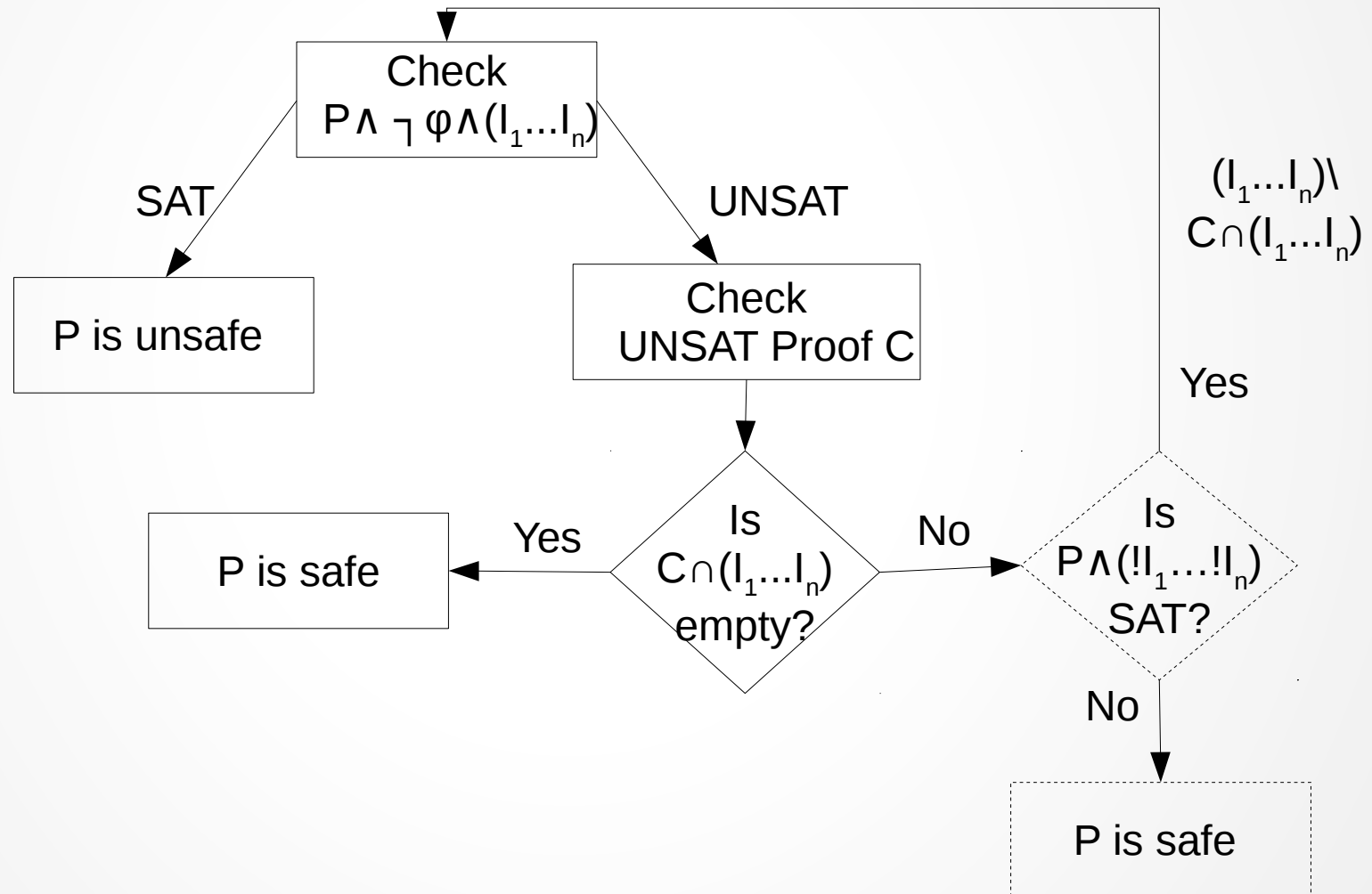
# Our Idea

## Different Strategies for Constraints

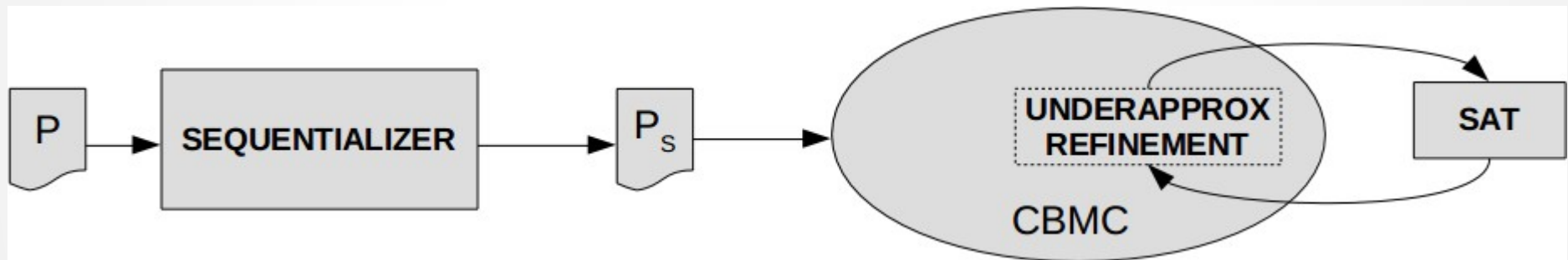
- Restrict each read to consider only writes from likely data-flow invariants.
  - In time store constrain read to map write set deduced by likely invariants.
- Starting from a subset of writes increase number of writes(monotonically increasing sets) to consider for each read.
  - If 1 to n positions of time store are allowed for a read then start with 1 to j, where  $j < n$ , and increment j towards n.
- [Grumberg et al.] considers number of interleavings for BMC of asynchronous concurrent system.

# Our Idea

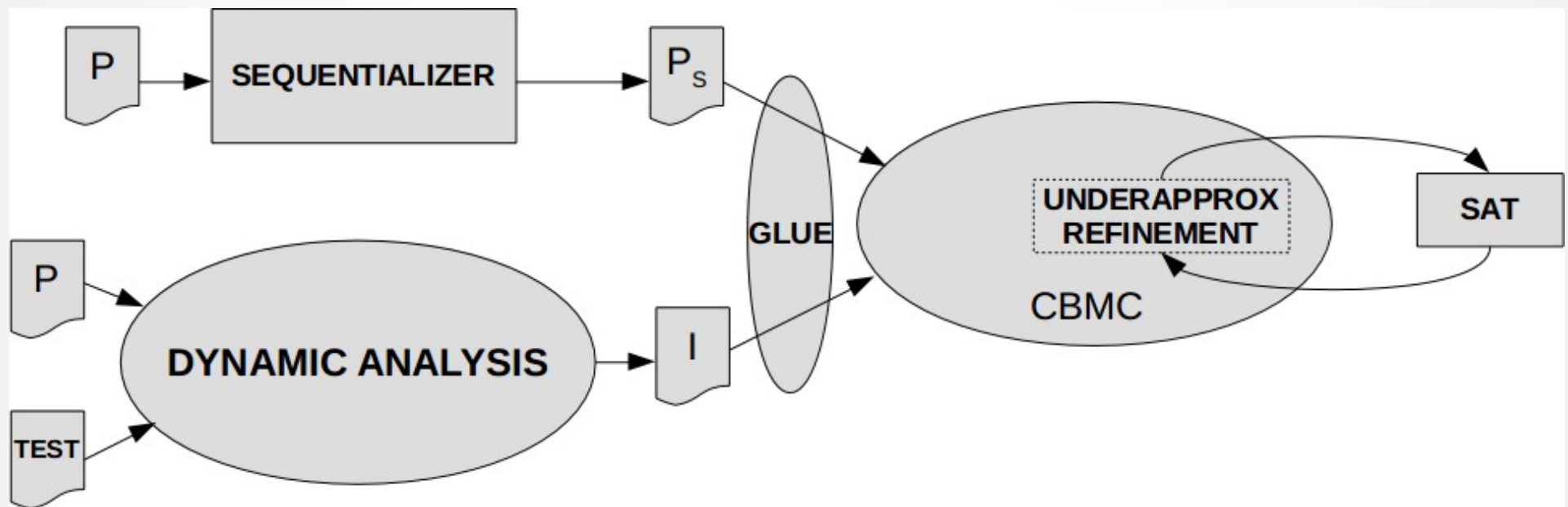
## Strategies for Refinement



# Design



# Design





# Technical Details

- Goals:
  - Underapproximation-refinement loop.
  - Encoding Defuse constraints in sequentialization.
  - Discovering DefUse invariants. (In Progress)
  - Experimentation. (In Progress)

# Technical Details

```
int read_i() {  
    unsigned short loc;  
    assume(iloc <= loc < MAXW);  
    assume(ts_i[loc+1] > ct);  
    iloc = loc;  
    if (ct < ts_i[loc]) ct = ts_i[loc];  
    return value_i[loc];  
}
```

Sequentialization from [Anand et al.]

# Technical Details

## Encoding

- Local/Remote
  - $\text{loc} = \text{iLoc}$  for local and  $\text{loc} > \text{iLoc}$  for remote
- Follower
  - $\text{prev\_loc} = \text{cur\_loc}$
- Write Set
  - $\text{loc} = \text{w1} \parallel \text{loc} = \text{w2} \dots$
- Passed as additional constraints along with a switch variable ( $\text{e12} \rightarrow (\text{loc} = \text{iLoc}) \ \&\& \ !\text{e12} \rightarrow (\text{iLoc} \leq \text{loc} < \text{MAXW})$ ).
- Arbitrary write set
  - $(\text{e12} \rightarrow (\text{iLoc} \leq \text{loc} < \text{MAXW}/2) \ \&\& \ !\text{e12} \rightarrow (\text{iLoc} \leq \text{loc} < \text{MAXW}))$

# Technical Details

## Refinement

- Implemented in CBMC Solver module.
- Uses MiniSAT's conflict feature.
- Initially all switch variables are assumed to be true.
- If none of switch variables are part of conflict then we return program is safe.
- If a switch variable is part of conflict then that variable is dropped from assumption.

# Technical Details

## Discovering Likely Invariants

- Defuse tool is not available.
- Currently implementing dynamic analysis tool using PIN.
- PIN can add hooks in binary which can be used to track reads.
- Requires address to symbol name translation, which is not provided by PIN.

# Technical Details

## Experiment

- Read can have potentially large set of writes.
- SVCOMP tests
- Benchmark used by ESMBC in [Cordeiro and Fischer]
- Benchmark used by Inspect, a runtime model checker [Yang et al.]
- Benchmarks used in systematic concurrency testing like [Wang and Hoang] and [Wang et al.]

# Preliminary Experiment

## With True Invariants (gain)

File	Flags	Runtime of decision Procedure	Refinement Progress
0_false_seq.c	NUM=5, unwind=10, status=VERIFICATION FAILED	2.759s	
0_false_seq_inv.c	NUM=5, unwind=10, status=VERIFICATION FAILED	2.548s	30, 1 iteration
0_false_seq.c	NUM=10, unwind=15, status=VERIFICATION FAILED	7.691s	
0_false_seq_inv.c	NUM=10, unwind=15, status=VERIFICATION FAILED	7.166s	45, 1 iteration
0_false_seq.c	NUM=15, unwind=20, status=VERIFICATION FAILED	19.602s	
0_false_seq_inv.c	NUM=15, unwind=20, status=VERIFICATION FAILED	14.439s	60, 1 iteration
0_false_seq.c	NUM=20, unwind=25, status=VERIFICATION FAILED	37.28s	
0_false_seq_inv.c	NUM=20, unwind=25, status=VERIFICATION FAILED	28.155s	75, 1 iteration
0_true_seq.c	NUM=15, unwind=20, status=VERIFICATION SUCCESSFUL	11.603s	
0_true_seq_inv.c	NUM=15, unwind=20, status=VERIFICATION SUCCESSFUL	8.647s	75, 1 iteration
2_true_seq.c	NUM=5, unwind=15, status=VERIFICATION SUCCESSFUL	0.557s	
2_true_seq_inv.c	NUM=5, unwind=15, status=VERIFICATION SUCCESSFUL	0.428s	10 to 0 in 2 iterations

# Preliminary Experiment

## With True Invariants (degenerates)

2_true_seq.c	NUM=10, unwind=25, status=VERIFICATION SUCCESSFUL	7.399s	
2_true_seq_inv.c	NUM=10, unwind=25, status=VERIFICATION SUCCESSFUL	8.609s	20 to 0 in 2; without property: 1.468s(UNSAT) + with only invariants: 3.917s
2_true_seq.c	NUM=15, unwind=35, status=VERIFICATION SUCCESSFUL	73.551s	
2_true_seq_inv.c	NUM=15, unwind=35, status=TIMEOUT	82.43s	30 to 0 in 2; without property: 6.698s(UNSAT) + with only invariants: 14.209s(UNSAT);
2_true_seq.c	NUM=20, unwind=45, status=TIMEOUT	365.19s	
2_true_seq_inv.c	NUM=20, unwind=45, status=TIMEOUT	889.136s	40 to 0 in 2; without property: 14.346s(UNSAT) + with only invariants: 153.443s(UNSAT)

$P \wedge (!I_1 \dots !I_n)$  check refinement performs better

1_true_seq.c	NUM=20, unwind=45, status=VERIFICATION SUCCESSFUL	6.014s	
1_true_seq_inv.c	NUM=20, unwind=45, status=VERIFICATION SUCCESSFUL	7.129s	40 to 0 in 2 iterations; 14.676s UNSAT;
1_true_seq.c	NUM=25, unwind=55, status=VERIFICATION SUCCESSFUL	9.368s	
1_true_seq_inv.c	NUM=25, unwind=55, status=VERIFICATION SUCCESSFUL	12.439s	50 to 0 in 2; without property: 22.168s UNSAT;
1_true_seq.c	NUM=30, unwind=65, status=VERIFICATION SUCCESSFUL	14.9s	
1_true_seq_inv.c	NUM=30, unwind=65, status=VERIFICATION SUCCESSFUL	18.14s	60 to 0 in 2; without property: 33.095s UNSAT;



# Preliminary Experiment

## Arbitrary write set

File	Flags(Timeout was 300s.)	Runtime of decision Procedure	Assumptions
fb_false.c	NUM=5, unwind=7	0.875s	
fb_false_inv.c		0.661s	20 to 6 in 5 iterations
fb_true.c	NUM=5, unwind=7	1.415s	
fb_true_inv.c		0.794s	20 to 5 in 7 iterations
fb2_false.c	NUM=6, unwind=8	1.311s	
fb2_false_inv.c		1.616s	24 to 7 in 7 iterations
fb2_true.c	NUM=6, unwind=8	3.428s	
fb2_true_inv.c		2.644s	24 to 7 in 7 iterations
fb3_false.c	NUM=11, unwind=15	44.833s	
fb3_false_inv.c		65.757s	44 to 8 in 5 iterations
fb3_true.c	NUM=11, unwind=15	271.689s	
fb3_true_inv.c		170.751s	44 to 3 in 6 iterations

Fibonacci programs from SVCOMP 2017  
4/6 programs performs better

# Preliminary Experiment

## Refinement Strategies

$\text{iloc} \leq \text{loc} < \text{MAXW}$	Point of reference.
$\text{loc} == \text{iloc}$	When true invariant: performs better in unsafe programs. Takes more time in safe except few cases. When not true invariant: takes more time.
$\text{iloc} \leq \text{loc} < \text{MAXW}/2$	Performs better for Fib programs.
$\text{!(loc} == \text{iloc)}$	Takes more time.
$P \wedge \text{!(loc} == \text{iloc)}$	For one program time taken to check this and verification is less.

# Next steps

- Defuse like Invariant generation using PIN.
- Experiment on different benchmarks.

# Future Directions

- Using likely inductive invariants to reduce  $L_c$ .
- Partitioning of traces [Farzan et al.].
- Technical
  - Finer refinement.
  - Experiment on real world software like Linux (Drivers or part of Implementation), Apache httpd, etc.
    - Require sequentialization support.

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